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Genome-wide association study for morphological and hunting-behavior traits in Braque Français Type Pyrénées dogs --Manuscript Draft--

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Abstract:	High-throughput genotyping offers great potential to increase our understanding of the genomic basis of canid variation. Braque Français Type Pyrénées (BRA) are smart, agile, and friendly dogs originally developed for tracking, hunting, and retrieving feathered game. On a population of 44 unrelated BRA dogs, single nucleotide polymorphism (SNP) genotype data from the CanineHD Whole-Genome Genotyping BeadChip and evaluation scores for 12 traits related to morphology and hunting performance were available. After quality filtering, 95 859 SNPs on the 38 dog autosomes (CFA) were retained. Phenotypic scores were expressed on a scale from 1 (worst) to 6 (best) and were mostly poorly to moderately correlated except for some morphological traits (e.g. r = 0.81 between the conformation of the head and that of the eye). From GWAS, a total of 378 SNP-phenotype associations with posterior odds larger than 1 have been detected. The strongest associations were found for the eye conformation, for the skull/muzzle ratio, and for connection to the hunter. These included both new and previously identified markers and genes potentially involved with type and behavior traits in BRA. Six of the significant markers mapped within SETDB2, a gene known to be related to pointing behavior in dogs. These results advance our understanding of the genetic basis for morphology and hunting behavior in dogs and identify new variants which are potential targets for further research.					
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3 4 5 6	Genome-wide association study for morphological and hunting-behavior traits in Braque Français Type Pyrénées dogs
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24 Abstract

High-throughput genotyping offers great potential to increase our understanding of the genomic 25 basis of canid variation. Braque Français Type Pyrénées (BRA) are smart, agile, and friendly dogs 26 originally developed for tracking, hunting, and retrieving feathered game. On a population of 44 27 unrelated BRA dogs, single nucleotide polymorphism (SNP) genotype data from the CanineHD 28 29 Whole-Genome Genotyping BeadChip and evaluation scores for 12 traits related to morphology and hunting performance were available. After quality filtering, 95 859 SNPs on the 38 dog 30 autosomes (CFA) were retained. Phenotypic scores were expressed on a scale from 1 (worst) to 6 31 (best) and were mostly poorly to moderately correlated except for some morphological traits (e.g. r 32 = 0.81 between the conformation of the head and that of the eye). From GWAS, a total of 378 SNP-33 34 phenotype associations with posterior odds larger than 1 have been detected. The strongest associations were found for the eye conformation, for the skull/muzzle ratio, and for connection to 35 the hunter. These included both new and previously identified markers and genes potentially 36 involved with type and behavior traits in BRA. Six of the significant markers mapped within 37 SETDB2, a gene known to be related to pointing behavior in dogs. These results advance our 38 understanding of the genetic basis for morphology and hunting behavior in dogs and identify new 39 variants which are potential targets for further research. 40

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42 Keywords: Braque Français Type Pyrénées; dogs; GWAS; behavior traits; type traits

43 Sport-hunting dogs have long been employed in assistance to hunters, reflecting strong behavioral pressure to locate and pursue quarry over great distances and variable terrain (Kim et al., 2018). At the same 44 45 time, humans have bred dogs also for different morphological traits like body type, size, skull shape, coat color (Shan et al., 2021). Behavior is a complex phenotype, i.e. it is under polygenic control and susceptible to 46 environmental influence, and it is often genetically correlated with other traits. For example, behavioral traits 47 in dogs are known to be related to body size (McGreevy et al., 2013). To date, several genes have been 48 49 identified which define breed-specific differences associated with morphological (Boyko et al., 2010; Hayward 50 et al., 2016; Vaysse et al., 2011) and hunting performance traits (Akkad et al., 2015; Kim et al., 2018).

Braque Français Type Pyrénées (BRA) dogs originate from an old type of gundog originally developed
for detecting, tracking, pointing and retrieving feathered game during hunting. Small size, high head posture,
smart, agile, energetic, indomitable temperament, good water confidence, collaborative in hunting, affectionate
and playful disposition are typical characteristics of this breed (Di Gerlando et al., 2019; Mastrangelo et al.,
2018a, 2018b).

This study used evaluation scores for 12 traits related to morphology and hunting behavior phenotypes
to conduct a GWAS in the BRA breed aimed at uncovering potentially associated genes.

A total of forty eight-months-old dogs (25 females, 19 males) registered in the Italian Kennel Club "ENCI were used. Morphological and hunting-behavior traits were scored by breed-expert judges from the Federation Cynologique Internationale (https://www.fci.be/en/) and ranged from 1 (poorest evaluation) to 6 (best evaluation). Traits and score ranges are summarized in Supplementary Table S1.

Genotyping data were retrieved from a previous study (Mastrangelo et al., 2018a). After excluding
SNPs that were unmapped, on the sex chromosomes, with call-rate < 95% and MAF (minor allele frequency)
< 5%, 95,859 SNPs were retained for the analysis. PLINK v.1.9 was used to process SNP data (Chang et al.,
2015). Missing SNP genotypes were imputed with LHCI (localized haplotype clustering imputation: Beagle
v.4.1, Browning and Browning (2016)). SNP positions from the CanFam3.1 genome sequence assembly (GCF
000002285.3) were used.

68 The association between SNP genotypes and morphological or hunting-behavior traits was tested using69 the following linear mixed model:

$$\mathbf{y} = \mathbf{X}\mathbf{b} + \mathbf{S}\boldsymbol{\alpha} + \mathbf{Z}\mathbf{u} + \mathbf{e} \tag{1}$$

72 where: y is the vector of phenotypes; b is the vector of systematic effects, i.e. intercept and sex; α is 73 the SNP (fixed) effect; **u** is the vector of polygenic (random) effects; **e** is the vector of residuals. **X**, **S** and **Z** 74 are the corresponding design matrices, relating records to sex, SNP genotypes and dogs. SNP genotypes were coded as the number of copies of the minor allele (0/1/2). Var(y) = Var(u) + Var(e) = K\sigma u^2 + I\sigma e^2, where K is 75 the matrix of genomic relatedness (VanRaden, 2008), I is the identity matrix, and σ_u^2 and σ_e^2 are the additive 76 77 genetic and residual variances. The model in equation (1) was run using the R package GenABEL v.1.8.0 78 (Aulchenko et al., 2007), separately for each SNP and each phenotype. To identify significant associations, we 79 estimated the posterior odds of true association (Burton et al., 2007), based on the GWAS power and the prior 80 probability of association. For 20% heritability, sample size of 50 individuals and type I error (unadjusted p-81 value threshold) equal to 0.001, the expected statistical power of a GWAS experiment is 60% (Visscher et al., 82 2017). Assuming 100 QTLs controlling the phenotypes, on average, the posterior odds of association were 83 estimated as:

$$Posterodds = \frac{prior probability \cdot power}{p - value}$$

85

where the prior probability is given by the ratio of the expected number of QTL for the trait (assumed 86 87 as 100) and the number of SNPs tested (95 859). SNP genotype-phenotype associations with posterior odds > 1 (higher odds that the SNP is associated with the phenotypes rather than it is not) were considered significant 88 89 results. Genomic regions showing significant results were further explored to identify candidate genes, using 90 the Genome Data Viewer developed by NCBI (https://www.ncbi.nlm.nih.gov/genome/gdv/browser/genome/?id=GCF 000002285.3). 91

Traits descriptives in male and female dogs are reported in Supplementary Table S2. The 12 traits showed mostly poor or moderately positive linear correlations (Figure 1), exceptions were the conformation of the eye and that of the head (r = 0.81). The only relevant negative correlations were found for the height at withers with game retrieval ability (r = -0.30) and aquaticity (r = -0.32).

96 From GWAS (equation (1)), 378 SNPs with posterior odds larger than 1 have been detected (Figures
97 2 and 3, Supplementary Table S3). The trait with the largest number of markers was the connection with the

hunter (n=144), followed by the skull/muzzle ratio (n=54) and aquaticity (n=49). Overall, approximately 130 genes have been identified. Table 1 lists the 18 most significant markers (posterior odds of association \geq 5).

100 In this communication, we focus on a few selected genes related to traits involved in morphological 101 and hunting-behavior traits. For the aptitude to collaborate (collaboration), we identified 15 markers on 7 chromosomes. The SNP BICF2P417531 (CFA 18) mapped within SHANK2, a gene involved in hyperactivity 102 and panic response in Terrier dogs (Kim et al., 2018). For the direction of the skull-facial axis (cranio-facial), 103 104 two SNPs on CFA 4 mapped in or close to ZMIZ1, a gene involved in a neuro-development disorder with 105 dysmorphic facies and distal skeletal anomalies (NEDDFSA) (Lu et al., 2022). As for the shape and position 106 of the eye, SNP BICF2S23626288 was found to lie within DNAH2, a gene from the gene-set previously reported to show statistically significant differences from expression analysis related to retinal degeneration in 107 several dog breeds (Goldstein, 2014). For the connection with the hunter (hunter), six markers (on CFA 22) 108 109 mapped within SETDB2, a gene that may contribute to pointing behavior (Akkad et al., 2015). Interestingly, 110 SETDB2 is also associated with the establishment of left-right asymmetry. Since the degree of motor laterality has been identified as a key predictor of success in guide-dog training, it can be speculated that variability in 111 112 SETDB2 might be associated with learning abilities that in turn may influence the establishment of pointing behavior (Akkad et al., 2015; Vaysse et al., 2011). Additional significant markers on CFA 22 (7 and 9 SNPs) 113 identified candidate genes (FNDC3A and CYSLTR2) previously reported to be under selection in dogs with a 114 breeding-for-hunting background (Vaysse et al., 2011). Other genes on CFA 22 linked to markers associated 115 116 with the 'hunter' trait include KPNA3, EBPL, RCBTB1, CAB39L, CDACD1, MLNR and RCBTB2. These genes have been identified within regions under selections in hunting dogs (Akkad et al., 2015; Perfilyeva et al., 117 118 2023; Yu et al., 2022). Among these, CAB39L is a candidate gene that affects the running speed and endurance in dogs (Perfilyeva et al., 2023). Finally, the SNP BICF2G630437454 on CFA 15 and associated with aquaticity 119 (water), mapped near (< 100 Kb) ACSS3, a gene that is hypothesized to contribute to the development of 120 121 temperament in dogs (Shan et al., 2021).

In this study, we have identified associations between genetic variants and morphological and huntingbehavior phenotypes in BRA. These included new and yet unreported, as well as previously identified, markers and genes potentially involved with type and behavior traits in *Canis familiaris*.

125 However, it must be acknowledged that this is a small-sized study, with limitations related to the statistical power of the analysis and to the robustness and generalizability of results. On the other hand, it is 126 127 true that dog genomes have undergone strong artificial selection with increased haplotype homozygosity and linkage disequilibrium, and therefore, compared to human studies, GWAS with relatively small sample sizes 128 can produce good results in dogs (Dodman et al., 2010; Lindblad-Toh et al., 2005). These results advance our 129 understanding of the genetic basis for morphology and hunting behavior in dogs and identify new variants 130 131 which are potential targets for further research. 132 **Conflict of interest statement** 133 None of the authors of this paper has a financial or personal relationship with other people or 134 organisations that could inappropriately influence or bias the content of the paper. 135 136 137 Acknowledgements We thank "ENCI" - Ente Nazionale della Cinofilia Italiana (Italian Kennel Club) for funding this 138 research and contributing the data used for this work. The funders had no role in study design. 139 140 **Disclosure statement** 141 142 No potential conflict of interest was reported by the authors. 143 144 Data availability 145 The data that support the findings of this study are available upon request from the corresponding author. 146 147 148 **Ethical statement** No experimental studies were conducted on these animals. Phenotypic records were provided by the 149 Italian Club Bracco Francese (officially recognized by the ENCI Italian Kennel Club- in 2006). Genotyping 150 data for the dogs included in this study were retrieved from a previous. Therefore, no ethical approval was 151 required. 152

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155 Appendix A: Supplementary material

- Supplementary Table S1: Definition of the semi-quantitative scores used to phenotype Braque Français type
 Pyrenées dogs for hunting behaviour (top) and morphological (bottom) traits.
- 158 Supplementary Table S2: Descriptive statistics of the morphological and hunting-behaviour phenotypes159 analysed in this study in males (M) and females (F).
- Supplementary Table S3: List of all 378 SNP-phenotype associations with posterior odds larger than 1 (235
 for hunting-behavior traits and 155 for morphological traits).

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- 217

218 **Table 1**

219 SNP-phenotype associations with posterior odds of true association larger than 5. Associations are first grouped by phenotype category (behavior,

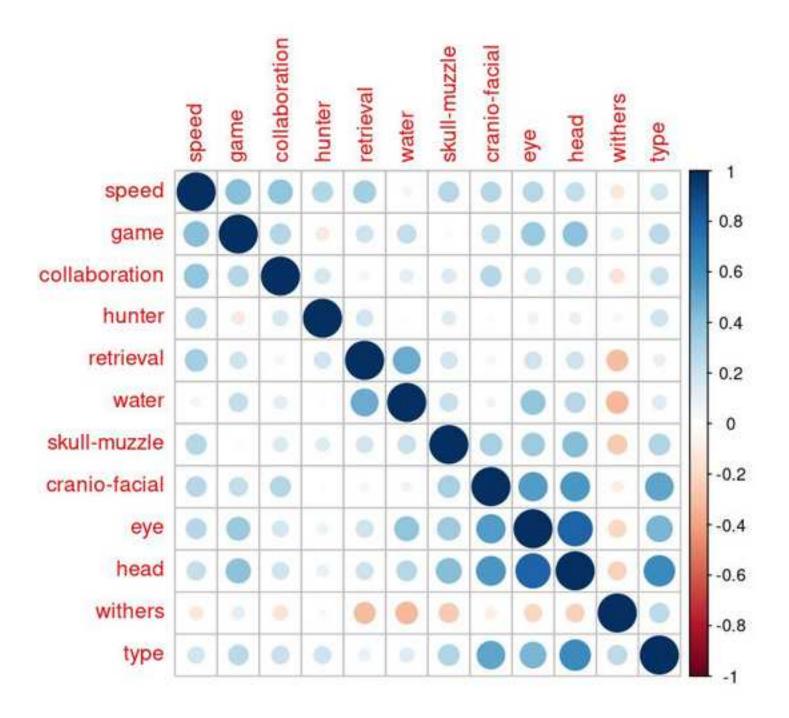
220 morphology), then by decreasing posterior odds of association.

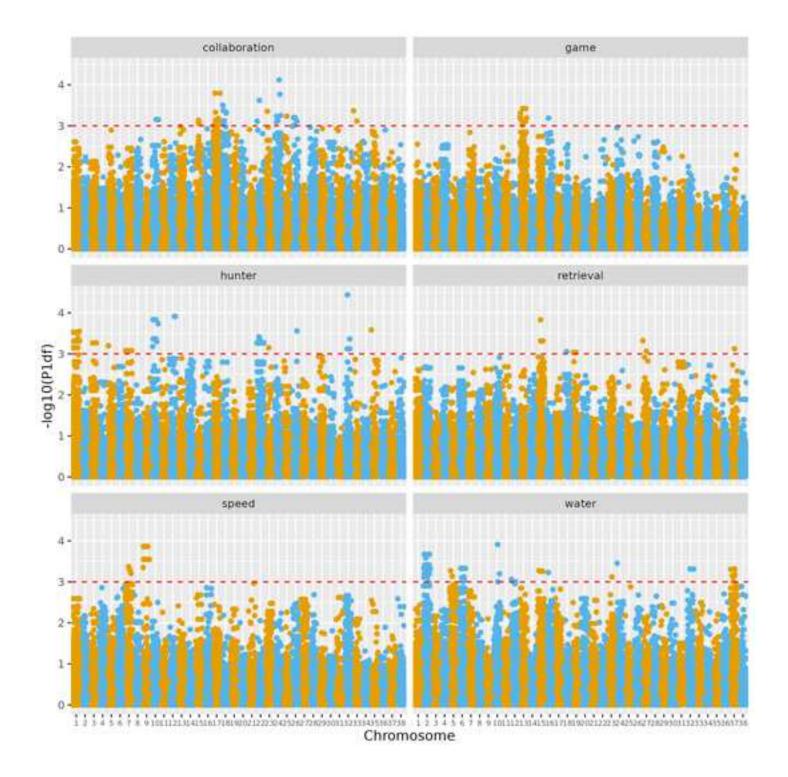
Туре	Trait	SNP	<i>p</i> -value	Post. odds	Chrom	Pos (bps)	Gene_within	Gene_near
behavior	hunter	BICF2G630598544	3.64E-05	17.202	32	10959734		SPARCL1
behavior	collaboration	BICF2G630510152	7.58E-05	8.256	24	10904518		
behavior	hunter	BICF2S23627579	0.0001218025262	5.139	12	46920426	CFAP206	
behavior	hunter	BICF2S23423118	0.0001218025262	5.139	12	47109734		ORC3
behavior	water	BICF2S23550231	0.0001220584142	5.128	10	65541626	LOC111097793	
morphology	eye	BICF2P153003	1.35E-05	46.486	5	33872506	STX8	
morphology	skull.muzzle	BICF2P289826	3.27E-05	19.138	29	21219943		KCNB2
morphology	skull.muzzle	BICF2G630623555	3.61E-05	17.321	29	21475891		
morphology	cranio.facial	BICF2P347412	5.22E-05	11.981	6	74946630	PTGER3	
morphology	head	BICF2S23410489	6.48E-05	9.654	5	27669801		
morphology	cranio.facial	BICF2G630198340	7.17E-05	8.730	26	33943479	PCDH15	
morphology	eye	BICF2P1303880	7.24E-05	8.643	13	13824164	LOC100686713	
morphology	skull.muzzle	BICF2S23656452	7.31E-05	8.564	6	18547621	LOC111096272	
morphology	type	BICF2G63091624	7.94E-05	7.882	22	59638332	LOC111091721	
morphology	skull.muzzle	BICF2S2414260	8.69E-05	7.200	31	30712199		MIR802
morphology	cranio.facial	BICF2P230586	0.0001036740769	6.037	2	15363081	ZEB1	
morphology	cranio.facial	BICF2P501332	0.0001061773921	5.895	6	74959030	PTGER3	
morphology	cranio.facial	BICF2P501333	0.0001061773921	5.895	6	74959125	PTGER3	

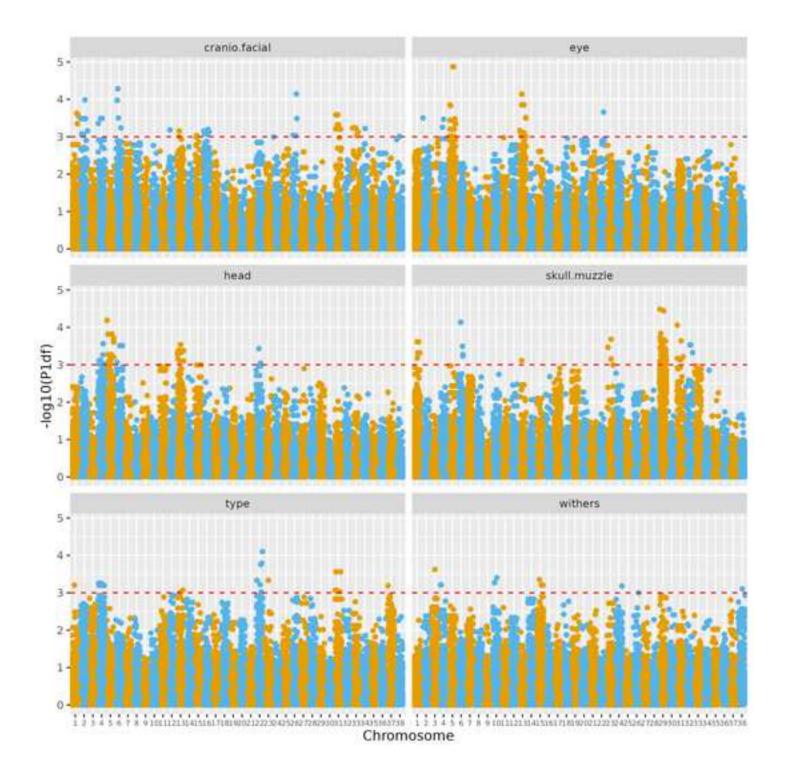
Figure legend.

Fig. 1. Correlation plot of the hunting-behavior and morphological traits measured on Braque

- 225 Français type Pyrénées dogs. Shades of blue indicate positive correlations, shade of red indicate
- 226 negative correlations (the darker the color, the stronger the correlation).
- **Fig. 2.** Manhattan plots of GWAS results for the six hunting behavior traits in Braque Français dogs.
- **Fig. 3.** Manhattan plots of GWAS results for the six morphology traits in Braque Français dogs.







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- GWAS for type and huntig-nehavior traits in Braque Français Type Pyrénées dogs
- 378 SNP-phenotype associations with posterior odds larger than 1 have been detected
- strongest associations for eye conformation, skull/muzzle ratio, connection to hunter
- six significant SNPs within *SETDB2*, a gene related to pointing behavior in dogs

Dear Editor(s) at The Veterinary Journal,

We are submitting our article with title "Genome-wide association study for morphological and hunting-behavior traits in Braque Français Type Pyrénées dogs" as Short Communication to be considered by your journal. This is a pilot study on the genetic background of morphology and hunting-behavior traits in a relatively understudied canine population. As pilot study, only a limited number of subjects was included, yet we believe that this work can be interesting given the novel traits and population addressed, and the rigorous and clearly described experimental approach. Our Short Communication consists of about 1,300 words (excluding abstract and references): please let us know if we need to make an extra effort to

shorten the text and/or amend our submission in any other ways.

Sincerely,

Filippo Biscarini
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